# Reproducible research with R

26th June 2013

## Bonus - figure building with make

- Introduction
   The problem of dependencies
   Automated figure building with make
- Basic use of make
   Simple rules
   Phony targets
- Going global
   Using a config.R file
   Wildcards, macros and patterns

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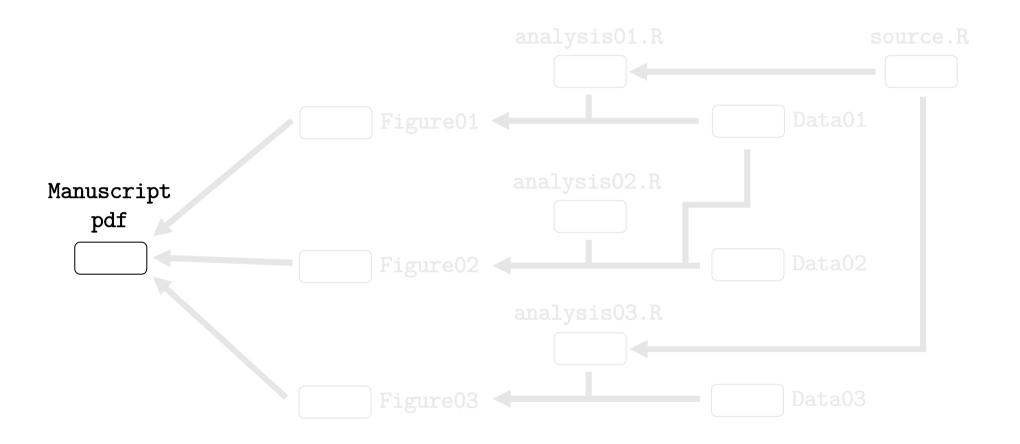
• Basic use of make

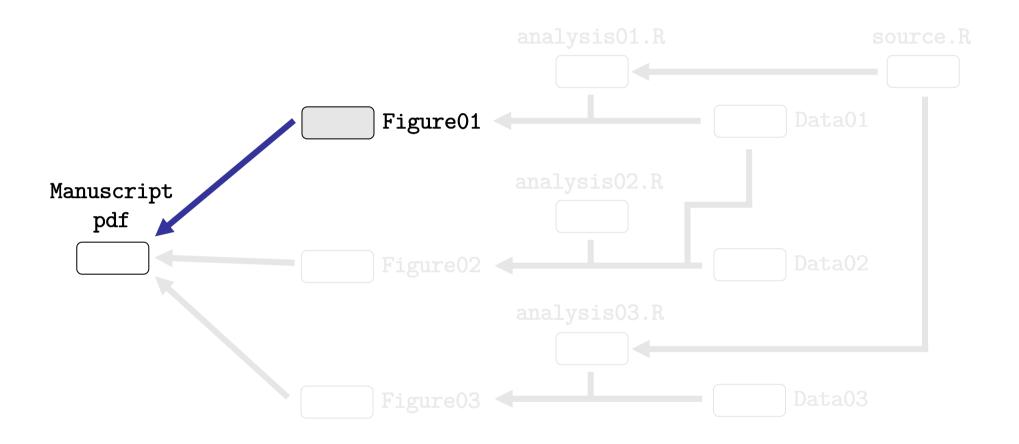
Simple rules Phony targets

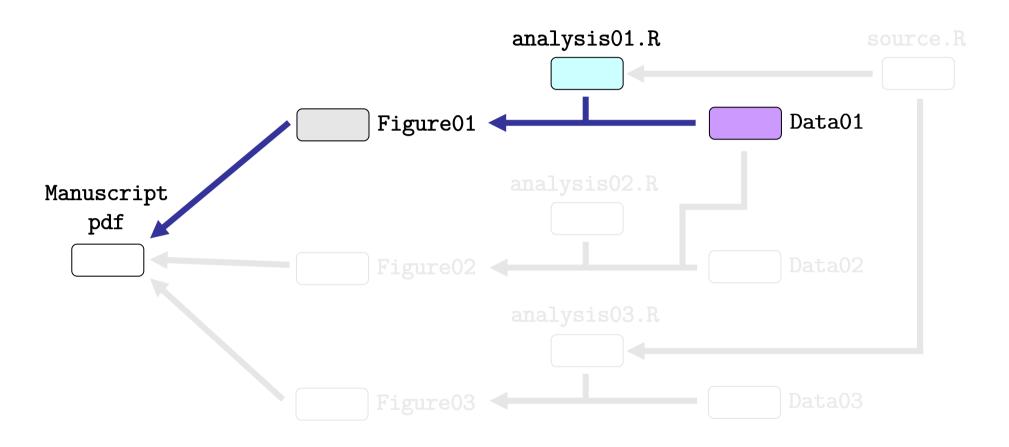
Going global

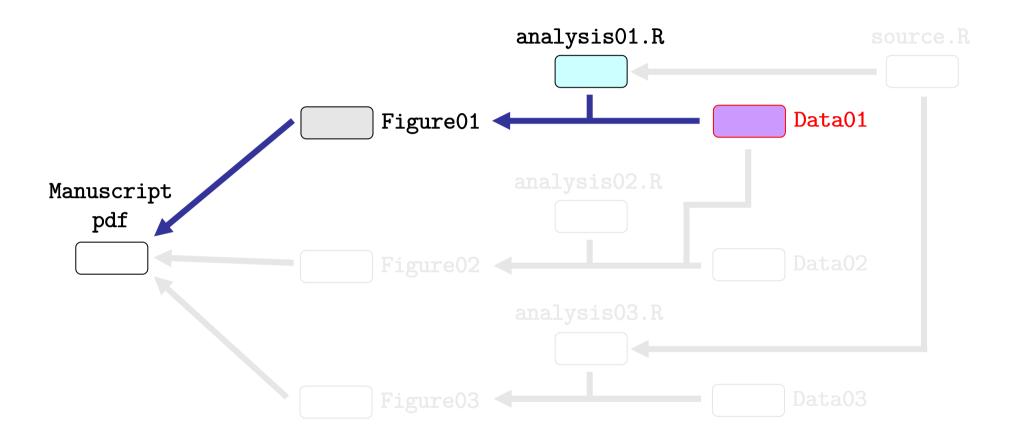
Using a config.R file Wildcards, macros and patterns

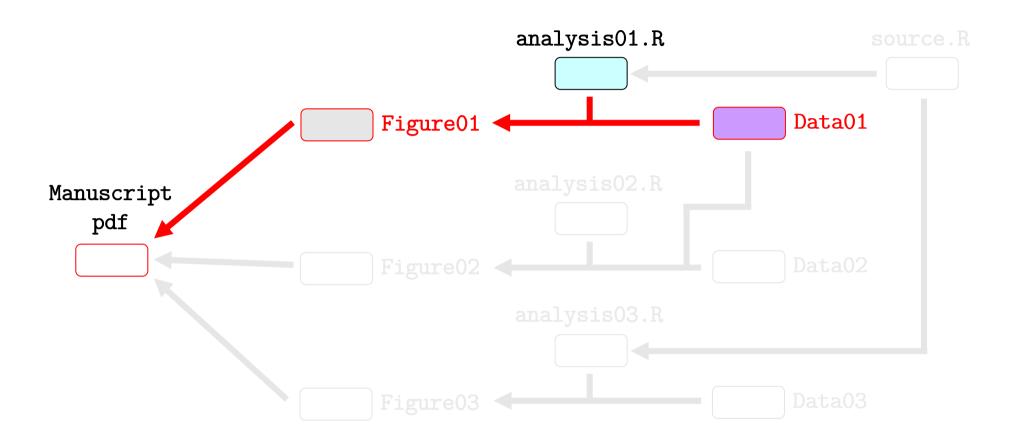
# Bonus Figure building with make

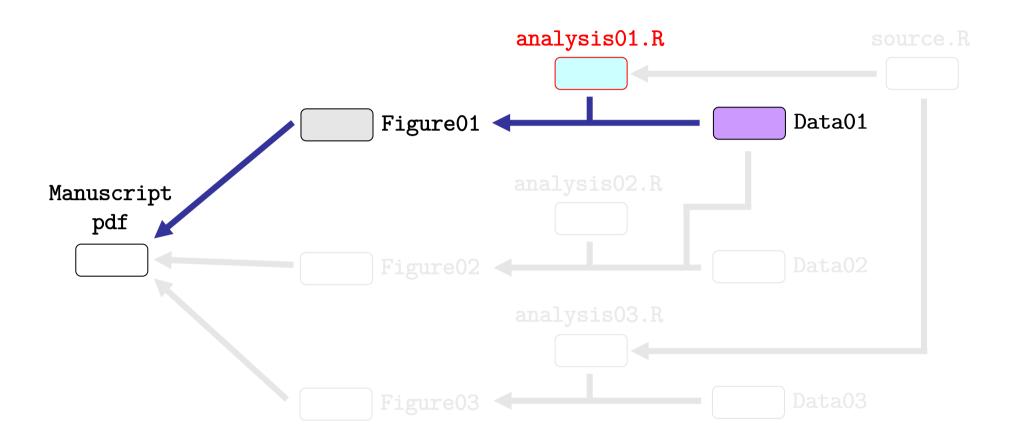


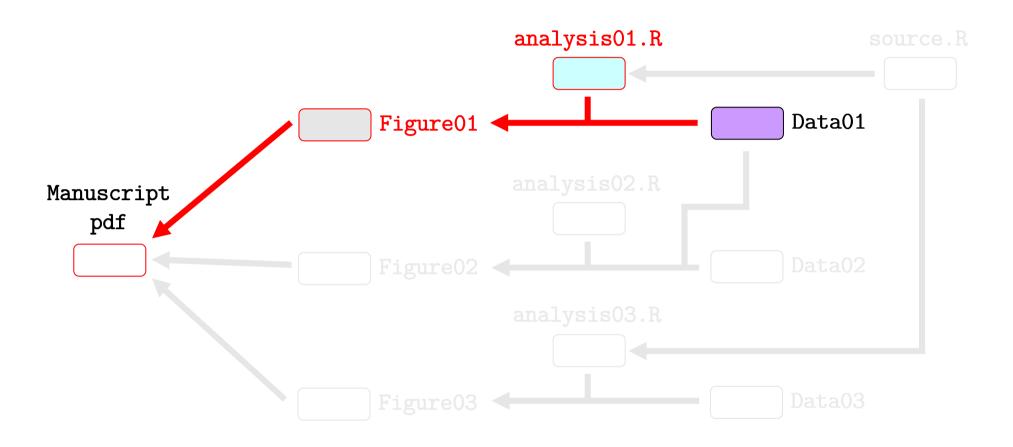


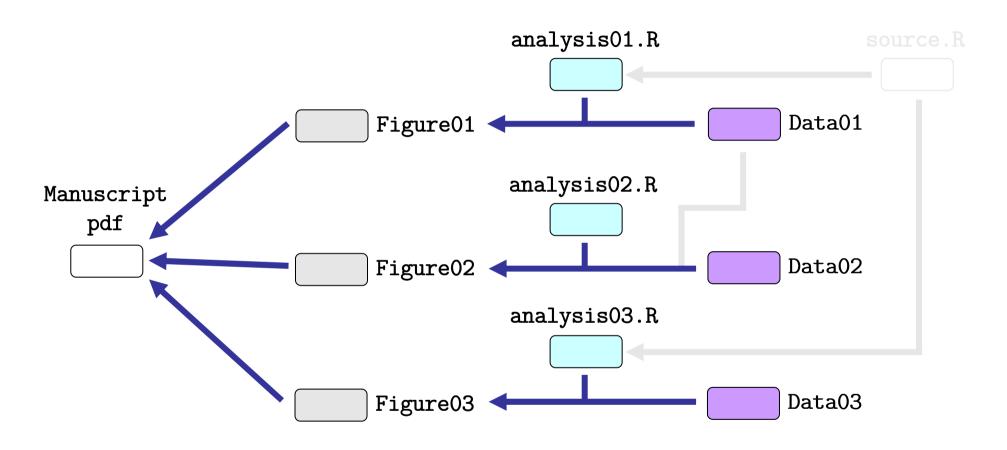


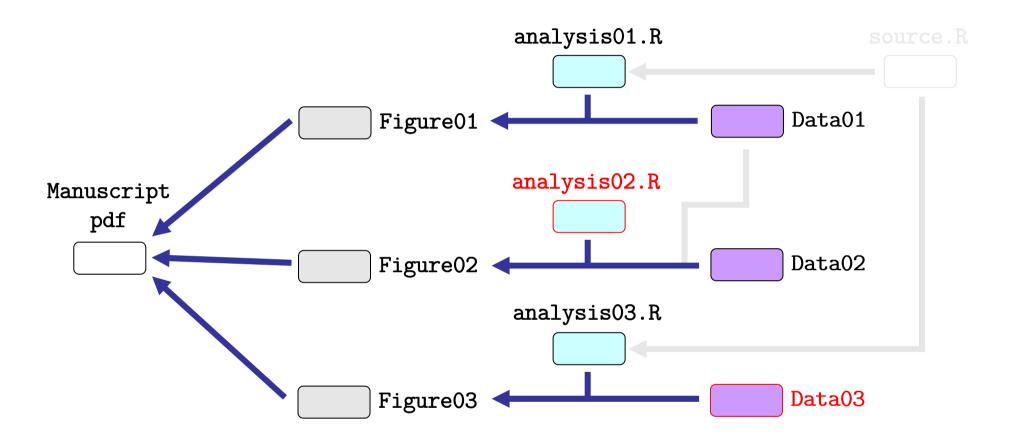


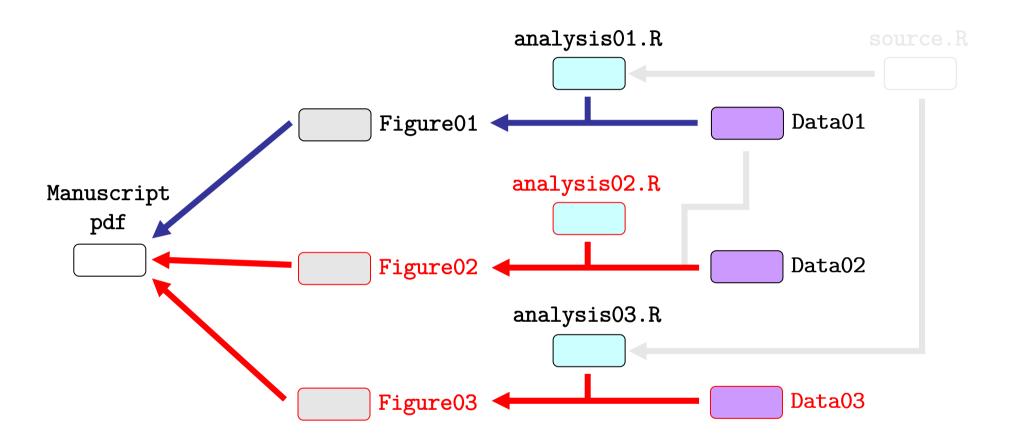


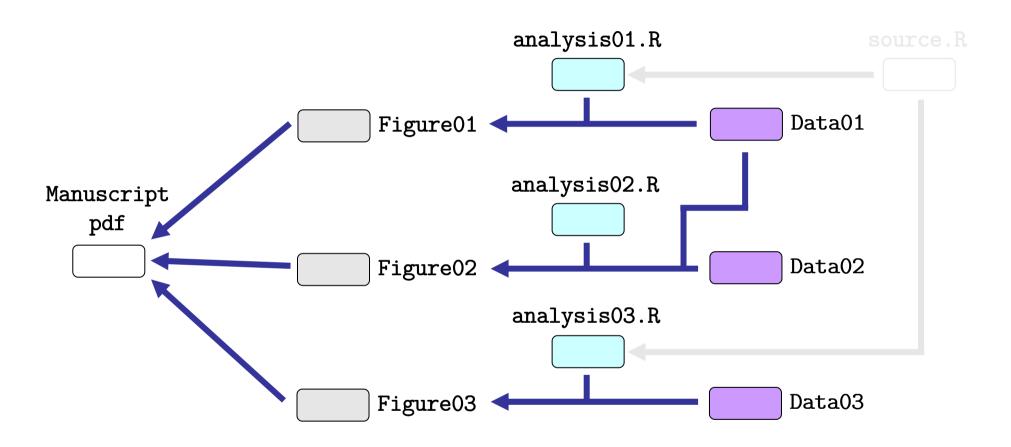


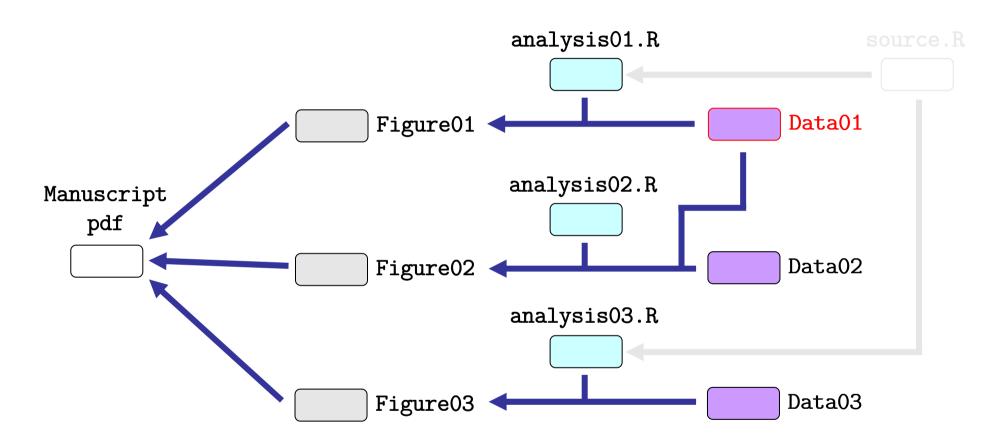


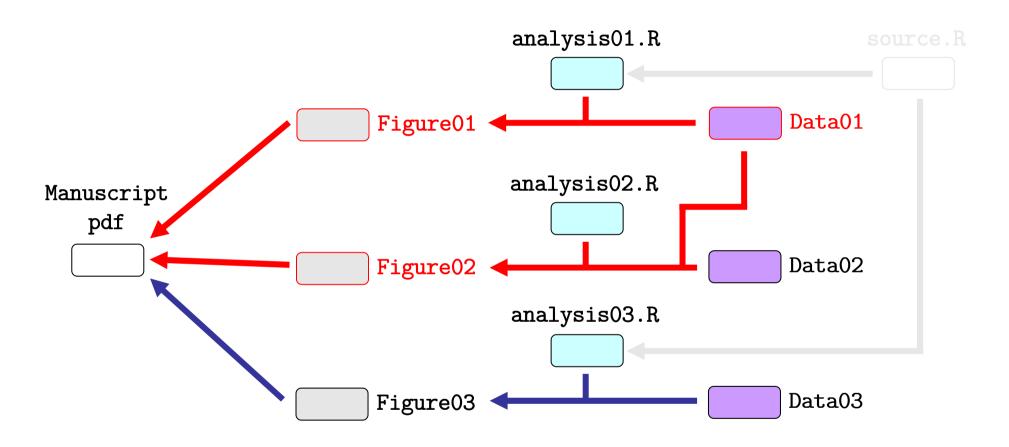


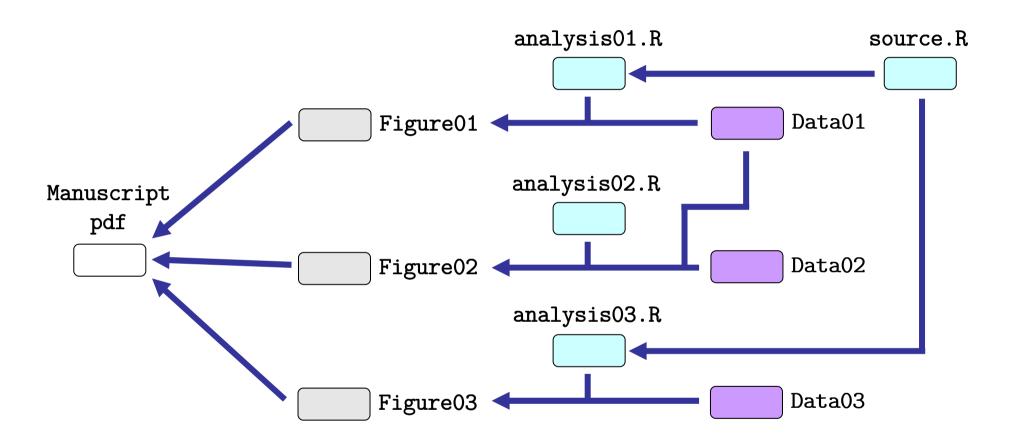


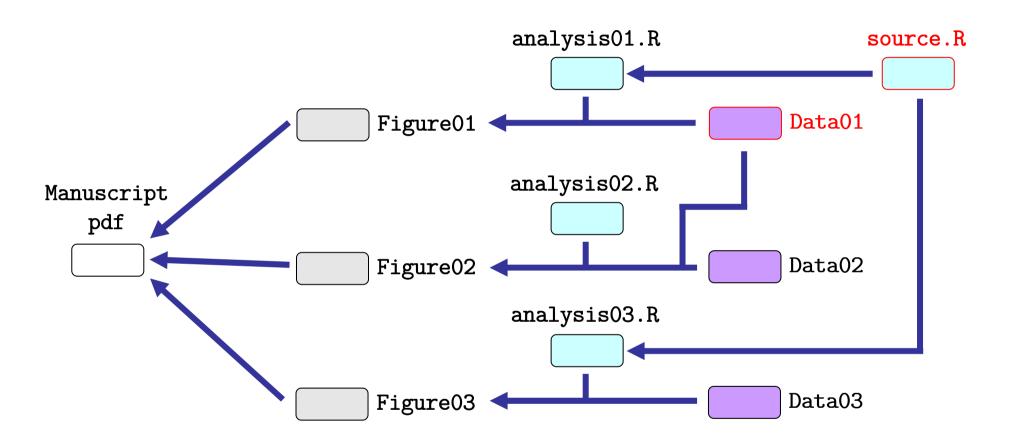


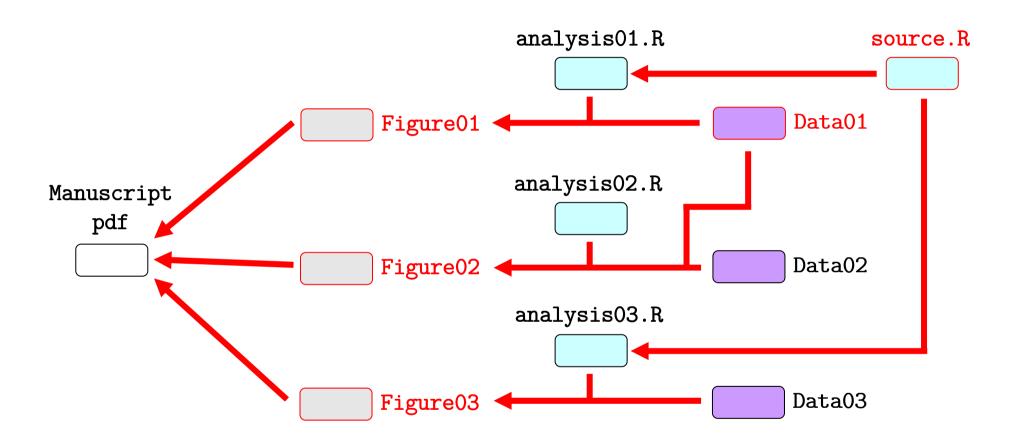












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- It is also error prone.
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# Basic use of make

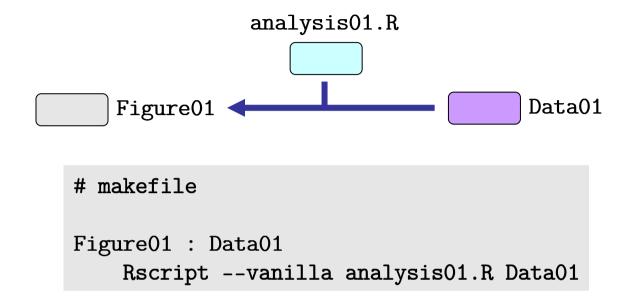
#### **Practical**

- make use will be introduced during a practical with RStudio.
- During the practical, we are going to generate four figures for a paper about Fiji earthquakes and Moomins.
- The first step is to have make running on our machine. This means adding the path to make to your Path environment variable if you are using Windows.

# Modifying the PATH (Windows 7)

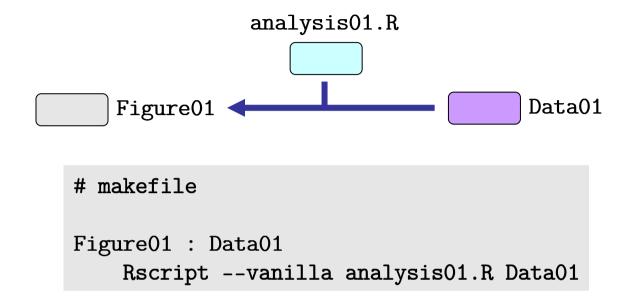
- Press the Windows key and the Pause key simultaneously.
- Click 'Advanced parameter settings > Environment variables > Path > Edit...'.
- Add the path corresponding to your make installation, separated from the previous path by a semicolon.
- e.g.: C:\Program Files\GnuWin32\bin
- Click 'Ok'.

#### The makefile

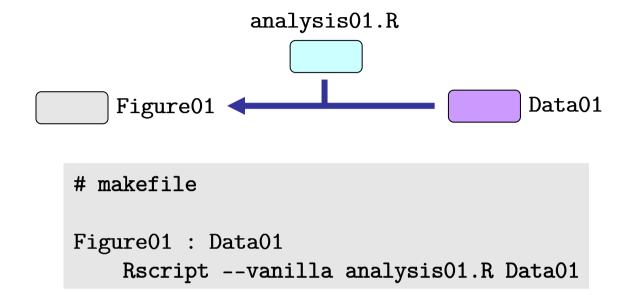


- make knows about the dependencies between files by reading a **makefile**.
- A makefile describes the relations between files using rules.
- Each rule has 3 parts: a **target**, a **prerequisite** and an **action**.

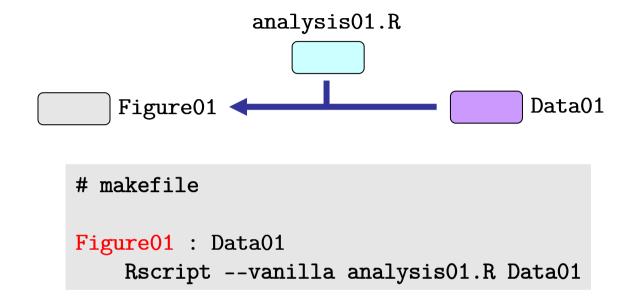
#### The makefile



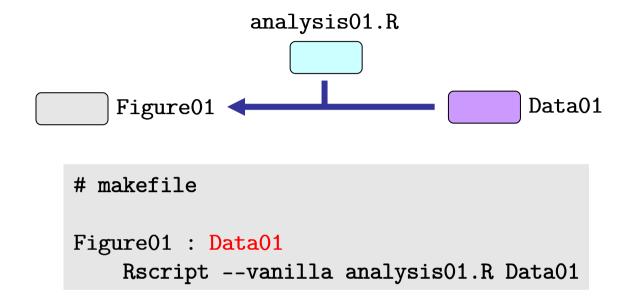
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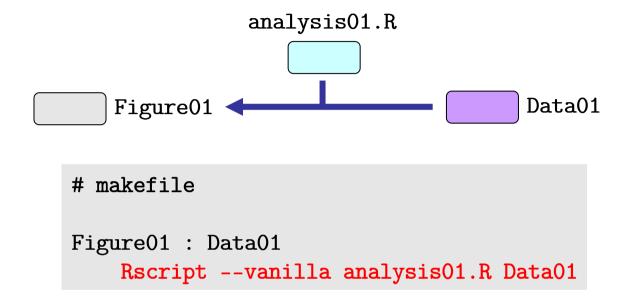
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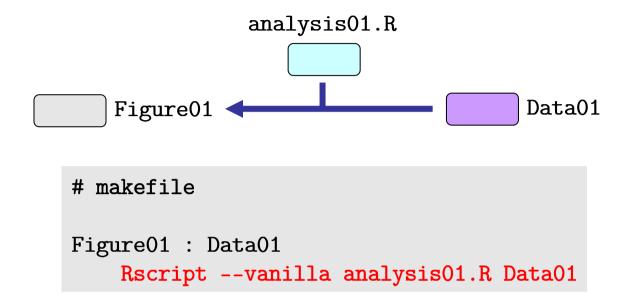
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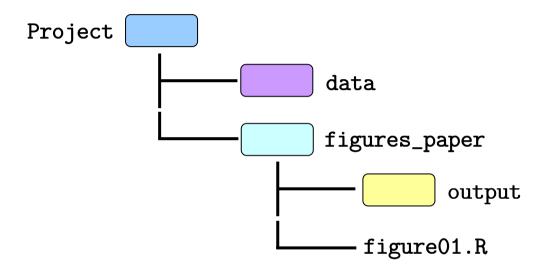
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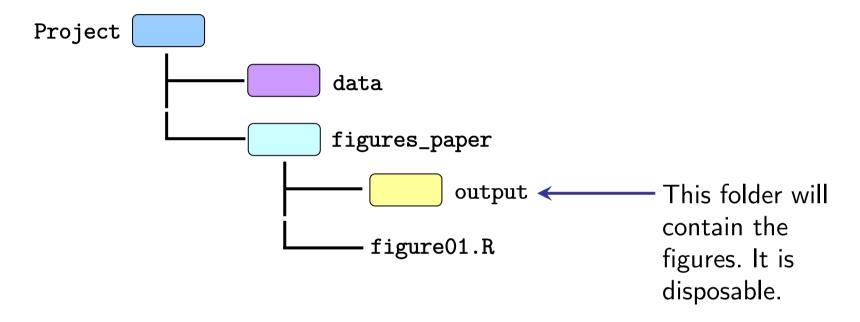


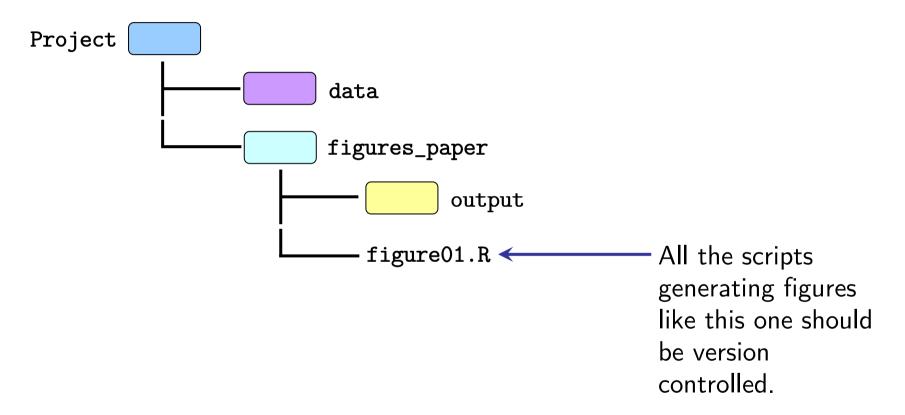
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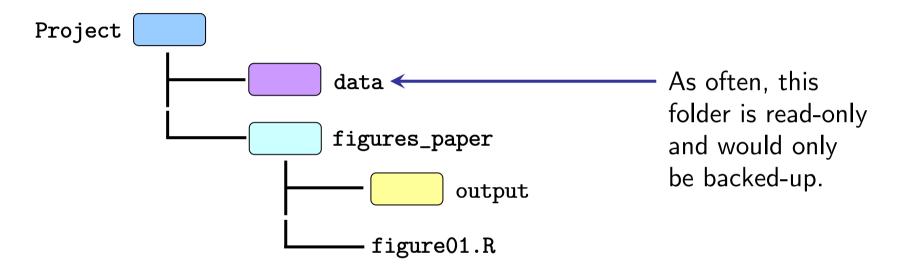


- Comments starts with #.
- Actions have to start with a tab character.

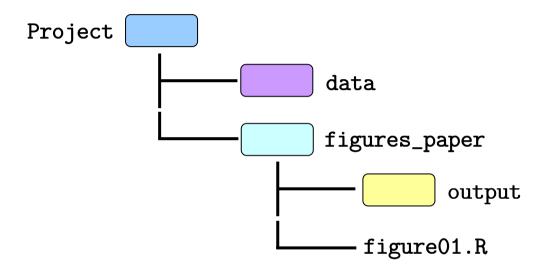








• Here is the structure of the folder used for the practical:



 As usual, reference files containing all the code we will use during the practical are available and stored in the reference\_files folder.

- Let's start a new RStudio session and create an empty script saved as figure01.R in ./figures\_paper.
- Make sure your working directory is ./figures\_paper.
- Our first figure will use a dataset included in R. It does not depend on an external data file.

 We start with a very simple plot and run the code with CTRL + SHIFT + S:

```
# figure 01 - Map of earthquakes off Fiji
# using R dataset 'quakes'

### data ###

long = quakes$long
lat = quakes$lat
depth = quakes$depth

### plot ###

plot(long, lat, asp = 1) # asp = 1 determine the aspect ratio
```

• We add the pdf command to save the plot to a file.

```
# figure 01 - Map of earthquakes off Fiji
# using R dataset 'quakes'
### data ###
long = quakes$long
lat = quakes$lat
depth = quakes$depth
### plot ###
pdf("../output/figure01.pdf",
    width = 6, height = 4, pointsize = 12)
plot(long, lat, asp = 1) # asp = 1 determine the aspect ratio
dev.off()
```

 We add a flag to choose whether to display the figure or to send it to the pdf file.

```
### parameters ###
write.pdf = FALSE
### data ###
[...]
### plot ###
if (write.pdf) {
pdf("../output/figure01.pdf",
    width = 6, height = 4, pointsize = 12)
}
plot(long, lat, asp = 1) # asp = 1 determine the aspect ratio
if (write.pdf) {
  dev.off()
```

 We want to tune a bit the look of the plot. For this, it is nice to have all the relevant parameters at the beginning of the file:

```
### parameters ###
# --- file output ---
write.pdf = T
# --- limits and margins ---
margins = c(2, 3, 2, 0)
xlim = c(165, 190)
vlim = c(-40, -10)
# --- title and axes ---
title.label = "Locations of earthquakes off Fiji"
x.values.at = seq(165, 190, by = 5)
y.values.at = seq(-40, -10, by = 10)
xlab = "Longitude"
ylab = "Latitude"
```

We then update the plot section:

```
### plot ###
#--- file output ---
if (write.pdf) {
pdf(file = "./output/figure01.pdf",
    width = 6, height = 4, pointsize = 12)
#--- empty plot ---
par(mar = margins) # set the outer margins
plot(0, 0, type = "n", xlim = xlim, ylim = ylim,
     xlab = "", ylab = "", axes = F, bty = "n",
     asp = 1) # asp = 1 determine the aspect ratio
#--- draw the points ---
points(long, lat, col = "blue", pch = 16, cex = 0.5)
#--- axes and title ---
axis(1, at = x.values.at)
axis(2, at = y.values.at, las = 1)
title(title.label)
#--- close the file ---
if (write.pdf) {
dev.off()
}
```

- We have a basic script generating a figure. Let's set write.pdf to TRUE and save the script.
- Create a file figures.mk in the figures\_paper folder.
- We can write in it the rule to build figure01.pdf:

 Note that the paths are relative to the location of the makefile.

- Open a terminal and go to the figures\_paper folder.
- As this point, you might also have to add the path to Rscript to your Path environment variable.
- Run make and specify the makefile by typing:

make -f figures.mk

- Run make again. Nothing happens since the figure is upto-date.
- Delete figure01.pdf and rerun make. The figure is automatically built because the file figure01.pdf does not exist yet.

• Let's add the axis label commands in our script:

```
### parameters ###
margins = c(3, 4, 2, 0)

### plot ###
#--- axes and title ---
mtext(xlab, 1, line = 2)
mtext(ylab, 2, line = 3)
```

• Let's run make again. The figure is updated because it depends on figure01.R and the dependency file is more recent than the target file figure01.pdf.

• make reads the makefile specified after -f:

```
make -f figures.mk
```

- If no file is specified, make will try to find a file called makefile or Makefile.
- This means we can be lazy by renaming figures.mk to makefile. We can then update the figure by typing only:

make

- Don't forget to set write.pdf to TRUE in the R script before running make, otherwise the figure file will never be updated.
- We will see later how to make things a bit simpler.

- The previous case was easy. Using make does not really improve things a lot.
- We can make things more interesting by adding another figure, which also only depends on only one file.
- Copy the file figure02.R from the reference\_files folder into the figures\_paper folder.

- The previous case was easy. Using make does not really improve things a lot.
- We can make things more interesting by adding another figure, which also only depends on only one file.
- Copy the file figure02.R from the reference\_files folder into the figures\_paper folder.

- The previous case was easy. Using make does not really improve things a lot.
- We can make things more interesting by adding another figure, which also only depends on only one file.
- Copy the file figure 02. R from the reference\_files folder into the figures\_paper folder and open it with RStudio.

- You might need to install the RgoogleMaps package into RStudio.
- Run the code within RStudio. If everything works fine, set write.pdf to TRUE.
- Now we are going to update our makefile.

- Delete the content of the output folder and run make.
- Only figure01.pdf is produced. Why?
- By default, make only applies the first rule it finds in the makefile.

• We can tell make to look for a specific rule:

```
make target
make output/figure02.pdf
```

 But this doesn't solve the problem: how can we tell make that it has to update several targets?

• The solution is to use a **phony target**. A phony target is a target which is not a file: it is never up-to-date and will always result in an update of its dependencies.

We can run make by typing:

```
make all # or
make  # if all is the first target in the file
```

- all is never up-to-date since there is no such file.
- make decides to update it: for this it must first apply the rules concerning the prerequisites for all (if any) and then execute the action specified for all.
- make applies the rules for figure01.pdf and figure02.pdf.
   Since there is no action specified for all, it stops here.

### Ex.3: more than one dependency

- We will build a figure which depends on more than one file.
- Copy the file figure 03.R from the reference\_files folder to the figures\_paper folder and open it with RStudio.

### Ex.3: more than one dependency

• Update the makefile:

# Ex.3: more than one dependency

- Run make.
- Delete the contents of output and run make again.
- You can play around by modifying slightly the scripts and the data file and running make.

# Another phony target: clean

- make can be used for other things than just building files.
- It can be used to clean a directory structure before running make all for example.
- clean is a common phony target. Let's add it at the end of the makefile (here is a Windows version of the action to remove the output files):

```
clean :
    rmdir /s /q output
    mkdir output
```

# Another phony target: clean

 We can clean our directory tree and rerun make from the beginning by typing:

```
make clean
```

 Any action that can be specified from the command line can be done by make.

# Going global

- The philosophy of using make is to manage the building process at a global level.
- This means we want to minimize the amount of tuning which is specific to each file.
- We can use a config.R file which will be sourced by each script to be able to change global settings in one place.

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- This means we want to minimize the amount of tuning specific to each file.
- We can use a config.R file which will be sourced by each script to be able to change global settings in one place.

 Let's start by modifying our existing code. In figure01.R, add the code to map depth to a color gradient:

```
### parameters ###
#--- colors ---
depth.ncol = 100
depth.col.shallow = "lightblue"
depth.col.deep = "darkred"

### plot ###
#--- prepare the color palette for depth ---
color.gradient = colorRampPalette(c(depth.col.shallow, depth.col.deep))
depth.colors = color.gradient(depth.ncol)
#--- draw the points ---
points(long, lat, col = depth.colors[cut(depth, depth.ncol)], pch = 16,
cex = 0.5)
```

Run the code after setting write.pdf to FALSE.

- We would like to be able to change the color of the depth gradient in figure 1 and 2 by specifying it in only one place.
- A good way to do it is to create a config.R file in the figures\_paper folder:

```
### Global settings ###

#--- depth color gradient ---
cfg.depth.col.shallow = "lightblue"
cfg.depth.col.deep = "darkred"
```

 We source this file into figure01.R and figure02.R and update the color gradient variables in those:

```
# (at the beginning of each file)
source("./config.R")

### parameters ###
#--- colors ---
depth.ncol = 100
depth.col.shallow = cfg.depth.col.shallow
depth.col.deep = cfg.depth.col.deep
```

 We mustn't forget to update the makefile with the new dependencies:

 Now let's change the colors in the gradient (config.R) and see if make updates the figures:

```
### Global settings ###

#--- depth color gradient ---
cfg.depth.col.shallow = "pink"
cfg.depth.col.deep = "purple"
```

```
make clean
make
```

• The idea is to use this for all that is common to several figures: cex, xlim, pdf.width, pdf.height, etc...

### Going global in the makefile

- The makefile itself can become cumbersome to manage when there is a lot of dependencies with similar names and patterns.
- It can be simplified by using wildcards and other mechanisms specific to make.
- Let's try to improve our makefile.

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### Going global in the makefile

- The makefile itself can become cumbersome to manage when there is a lot of dependencies with similar names and patterns.
- It can be simplified by using wildcards and other mechanisms specific to make.
- Let's add a fourth figure showing Moomin's path after drinking a few glasses of Salmiakki.
- Copy the file figure 04.R from the reference\_files folder to the figures\_paper folder.

- figure04.R takes as arguments data files recording Moomin's position on his island in Naantali.
- It can make as many records as we want.

Rscript --vanilla figure04.R ../data/moomin\_walk\_01.dat ../data/moomin\_walk\_02.dat

• Let's update the makefile:

• When we run make, figure04.pdf is generated.

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- We have to specify those prerequisites in the action.
- \$^ is a special variable containing the prerequisites.

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- But \$^ also contains figure04.R.
- We have to remove figure04.R from the action.

```
# makefile for figures for the paper
# "Fiji Earthquake and Moomin paintball"
all: output/figure01.pdf output/figure02.pdf output/figure03.pdf output/figure04.pdf
output/figure01.pdf : figure01.R config.R
          Rscript --vanilla figure01.R
output/figure02.pdf : figure02.R config.R
          Rscript --vanilla figure02.R
output/figure03.pdf : figure03.R ../data/paintball_data
         Rscript --vanilla figure03.R
output/figure04.pdf : ../data/moomin_walk_*.dat
         Rscript --vanilla figure04.R $^
output/figure04.pdf : figure04.R
```

- We can also separate the prerequisites into two rules.
- When several rules describe a target, the prerequisites are the union of all prerequisites.

```
# makefile for figures for the paper
# "Fiji Earthquake and Moomin paintball"
all: output/figure01.pdf output/figure02.pdf output/figure03.pdf output/figure04.pdf
output/figure01.pdf : figure01.R config.R
          Rscript --vanilla figure01.R
output/figure02.pdf : figure02.R config.R
          Rscript --vanilla figure02.R
output/figure03.pdf : figure03.R ../data/paintball_data
         Rscript --vanilla figure03.R
output/figure04.pdf : ../data/moomin_walk_*.dat
         Rscript --vanilla figure04.R $^
output/figure04.pdf : figure04.R
```

 This should work but somehow I didn't manage to run it correctly...

```
# makefile for figures for the paper
# "Fiji Earthquake and Moomin paintball"
all: output/figure01.pdf output/figure02.pdf output/figure03.pdf output/figure04.pdf
output/figure01.pdf : figure01.R config.R
          Rscript --vanilla figure01.R
output/figure02.pdf : figure02.R config.R
          Rscript --vanilla figure02.R
output/figure03.pdf : figure03.R ../data/paintball_data
         Rscript --vanilla figure03.R
output/figure04.pdf : ../data/moomin_walk_*.dat
         Rscript --vanilla figure04.R $^
output/figure04.pdf : figure04.R
```

Other special variables are \$0 (rule's target), \$< (rule's first prerequisite) and \$? (rule's out-of-date prerequisites).</li>

So this is our current makefile.

We could also use wildcards here.

• We could also use wildcards here.

• If we modify config.R, make updates the correct files.

• If we do make clean, make will not regenerate the figures afterwards.

• This is because figure\*.pdf do not exist on the hard drive when make reads the makefile, so there is nothing to update.

• ../data/moomin\_walk\_\*.dat works because those files are not built by make and always pre-exist the make run.

 So here we have no choice and must keep the detailed dependencies.

- What about our manual tuning of write.pdf?
- We can modify each script so that they read an argument determining if the pdf should be produced or not.
- Let's modify the 3 first scripts (but not figure04.R) this way:

```
# --- file output ---
write.pdf = F # default
arguments = commandArgs(trailingOnly = T)
if (length(arguments) > 0 && arguments == "pdf") {
write.pdf = T
}
```

- Now we can run make and produce the pdf files or run the scripts from within RStudio without manually changing this flag.
- We did not apply this to figure04.R because we would need to insert the pdf argument between the script name and the data file names. It would be possible if we could separate rules but I didn't manage to do it.

```
# action wanted
Rscript --vanilla figure04.R pdf data01 data02 ...

# action in the rule
Rscript --vanilla $^

# We would need to put 'pdf' in the prerequisites, which we cannot do
```

- Now we can run make and produce the pdf files or run the scripts from within RStudio without manually changing this flag.
- We did not apply this to figure04.R because we would need to insert the pdf argument between the script name and the data file names. It would be possible if we could separate rules but I didn't manage to do it.

#### Makefile: macros

- Another feature of make is the use of macros.
- Macros are variables defined within the makefile.

```
# makefile for figures for the paper
# "Fiji Earthquake and Moomin paintball"
# Rscript configuration
R_COMMAND = Rscript --vanilla
# rules
all: output/figure01.pdf output/figure02.pdf output/figure03.pdf ...
output/figure01.pdf : figure01.R
        $(R_COMMAND) figure01.R
output/figure02.pdf : figure02.R
        $(R_COMMAND) figure02.R
. . .
```

#### Makefile: macros

This can also be used for directories.

```
# makefile for figures for the paper
# "Fiji Earthquake and Moomin paintball"
# Rscript configuration
R_COMMAND = Rscript --vanilla
# output directory
DIR = output
# rules
all: $(DIR)/figure01.pdf $(DIR)/figure02.pdf $(DIR)/figure03.pdf ...
$(DIR)/figure01.pdf : figure01.R
        $(R_COMMAND) figure01.R
$(DIR)/figure02.pdf : figure02.R
        $(R_COMMAND) figure02.R
. . .
```

### Makefile: patterns

- The last feature we'll see today is patterns.
- Patterns can define rules to build similar files.

```
# makefile for figures for the paper
# "Fiji Earthquake and Moomin paintball"
# Rscript configuration
R_COMMAND = Rscript --vanilla
# output directory
DIR = output
# rules
all: $(DIR)/figure01.pdf $(DIR)/figure02.pdf $(DIR)/figure03.pdf ...
$(DIR)/figure%.pdf : figure%.R config.R
        $(R_COMMAND) $< pdf
$(DIR)/figure03.pdf : ../data/paintball_data
$(DIR)/figure04.pdf : ...
```

### Makefile: patterns

- This works for figure01.R, figure02.R and figure03.R because the action is the same.
- If we were to include the data file names into the script for figure04.R, our whole makefile could be:

• All the actions are described by a single rule. The others just describe the specific dependencies for update.

#### In brief

- make is an efficient tool to automate figure building.
- make is an old program and its syntax can be quite cumbersome.
- Complex makefiles can be hard to debug, but simple ones are often enough for figure building.

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# Further reading and references

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#### **Software carpentry**

A reference with very clear lessons on many topics

```
http://software-carpentry.org/
http://software-carpentry.org/4_0/make/
```

#### **GNU** make

- <a href="http://gnu.org/software/make/">http://gnu.org/software/make/</a>
- For windows: <a href="http://gnuwin32.sourceforge.net/packages/make/">http://gnuwin32.sourceforge.net/packages/make/</a>

#### Beyond make: GnuWin, general Unix-like tools for Windows

- <a href="http://gnuwin32.sourceforge.net/">http://gnuwin32.sourceforge.net/</a>
- Very useful: <a href="http://gnuwin32.sourceforge.net/packages/coreutils.htm">http://gnuwin32.sourceforge.net/packages/coreutils.htm</a>